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**The Eurozone deposit rates' puzzle:
choosing the right benchmark**

Julien PINTER, Charles BOISSEL

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The Eurozone deposit rates' puzzle: choosing the right benchmark¹

Julien PINTER (Université Paris 1, Amsterdam University, University of Saint Louis²)

Charles BOISSEL (Paris HEC³)

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Abstract:

The paper proposes an alternative benchmark to the EURIBOR to analyze the post-crisis puzzling behavior of deposit rates in the Eurozone. Using bank-level CDS data for 6 major euro-countries, we build a simple country-level index for banks' cost of unsecured funding. The use of this index instead of the traditionally used EURIBOR restores the cointegration relationship between deposit rates and their reckoned opportunity cost. It also suggests that deposits have actually not been significantly over-remunerated in most euro area countries since the financial crisis, in contrast with what is often argued. Our index appears as a good alternative to the EURIBOR, which we show has become irrelevant for many countries.

Key words: deposit rates, euribor, cointegration, panel estimates, banks

JEL classification: E43; E50; G10; G21

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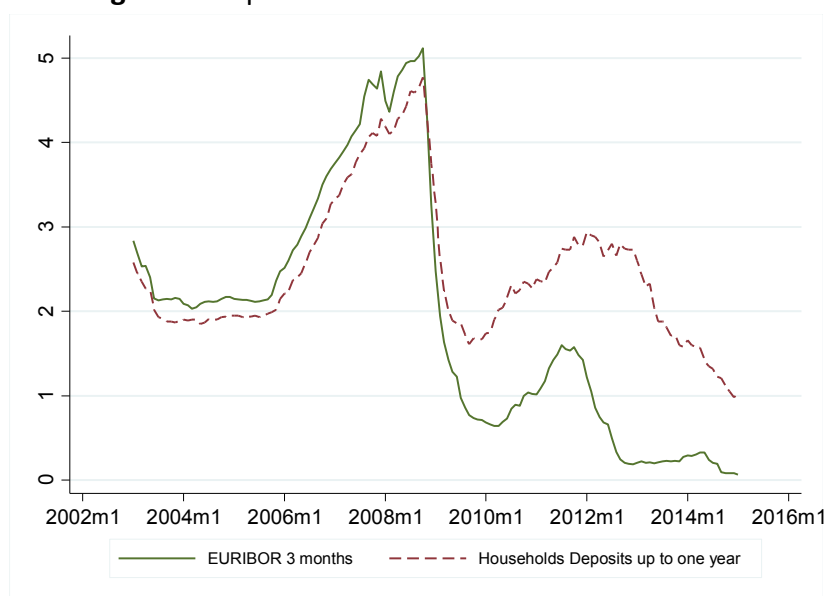
² Mail: julien.pinter@gmail.com

³ Mail: charles.boissel@hec.edu. Visiting Harvard University from August 2015 till June 2016.

1. Introduction

In this study, we focus on the main instrument of bank funding in the Eurozone, namely deposits from non-banks (European Central Bank⁴, 2012a)⁵. A puzzling feature about banks deposits is that they seem to have been remunerated at relatively high rates compared to bank's wholesale funding costs since the 2008 financial crisis. Deposit rates, which were closely following the Euro Interbank Offered Rate (EURIBOR henceforth) before the crisis, have diverged substantially from it since then (Figure 1). Banks thus seem to have been willing or constrained to pay more for deposits than what they pay for funding on the wholesale market. This is particularly true for periphery countries (Figure 7 and 8, Appendix 1). In an economy such as the Eurozone where banks are the main vector of monetary policy transmission and where high bank funding costs have been a key factor preventing lending rates from adjusting downwards (Illes *et al.*, 2015), the issue appears of prime importance.

Figure 1: Deposits rates and the EURIBOR in the Eurozone



Source: ECB

Few papers mention explanations for this post-crisis phenomenon. ECB (2012a) and ECB (2009) mention the persistent risks on unsecured funding, pushing banks to attract deposits at higher prices. ECB (2012a) also insists on the regulation incentives to increase stable source of funding. Daracq Paries *et al.* (2014) mention banks' reluctance to pass low rates on their depositors.

This paper takes another approach and argues that this "puzzle" is mainly due to the fact that the EURIBOR has become an inappropriate proxy for banks wholesale funding costs, and thus has become irrelevant as a benchmark. The reason for the use of EURIBOR as a benchmark is that banks traditionally price deposits relative to the cost of unsecured funding

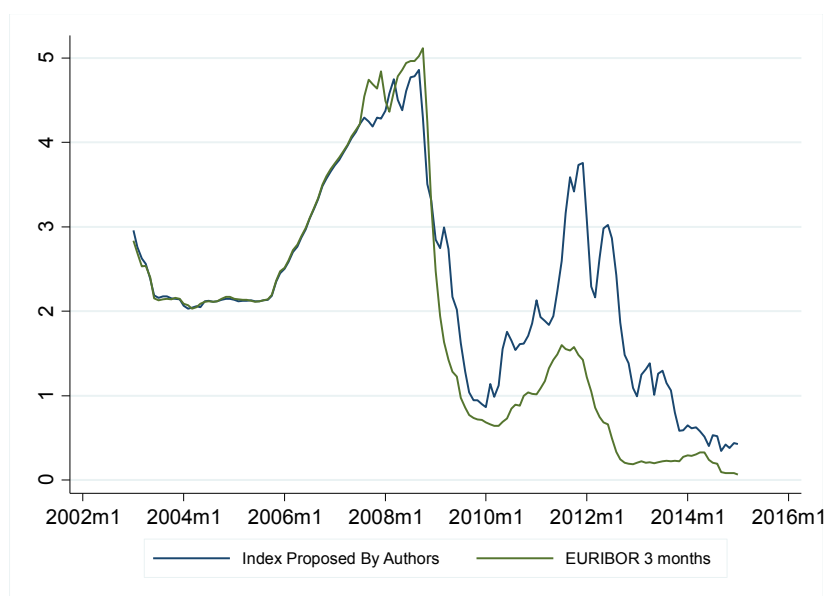
⁴ ECB henceforth.

⁵ At the end of 2011, non-bank deposits were on average about 35% of banks liabilities, with a median value reaching 43.5% (ECB, 2012a). Hence, deposits weigh heavily on bank funding costs in the Eurozone.

(Cadamagnani *et al.*, 2015; Sander and Kleimeier, 2004). This cost of unsecured funding was tightly linked to EURIBOR for the majority of banks before the crisis, but it then substantially diverged from it as bank funding conditions became severely heterogeneous (ECB, 2012b). In effect, this means that the cost of unsecured funding for Spanish banks for instance have substantially diverged from the cost of unsecured funding for German banks after the crisis. Using the EURIBOR for these two countries will lead one to misleadingly assume similar or connected costs of funds, thereby leading to distorted conclusions.

Using the standard theory on the structure of interest rates, we build an index for banks' cost of unsecured funding at the country-level, using a risk-free rate and a weighted average of banks' risks premium (as measured by their CDS). This index is very close to the EURIBOR before the 2008 financial crisis in each country we analyze (Figure 2), but then substantially diverges from it in most countries, especially for periphery-countries.

Figure 2: Authors' index for the cost of unsecured funding versus EURIBOR



Source: Authors' sample, ECB

We obtain two results from the use of our index. First, the use of our index restores the cointegration relationship between deposit rates and the cost of unsecured funding. Panel cointegration tests indeed fail in the post crisis period with the EURIBOR, but lead the expected result with our index. Running similar tests at the country-level shows that the relationship with the EURIBOR has become especially irrelevant for periphery countries, unlike the relationship with our index. Our index thus appears as a more relevant benchmark than the EURIBOR to understand deposit pricing in the Eurozone. Second, the use of our index shows that deposits have not been significantly over-remunerated since the 2008 financial crisis, unlike what is commonly argued. Building counterfactuals rates from standard panel models, we show that 72% of the seemingly "over-remuneration" of deposits is simply due to the use of the EURIBOR as a benchmark.

The rest of the paper is organized as follows: section 2 presents the conventional theoretical framework for deposit pricing, reviews the shortcomings of the EURIBOR and explains how we build our index. Section 3 presents the data and the empirical method. Section 4 presents the empirical results, and section 5 the graphical analysis. Section 6 concludes.

2. Theoretical considerations

2.1 The conventional framework for deposit pricing

It is common in academic studies since the work of Cottarelli and Kourelis (1994) at least to link deposit or lending rates to money market rates, the later being considered as a good proxy for the marginal cost of funding. In the conventionally used model, the bank interest rate (BR) is set by banks depending on a marginal cost price (MC):

$$BR = \theta_0 + \theta MC$$

The coefficient θ_0 is a markup over the banks' marginal costs due to transaction costs, while the size of the parameter θ depends on the demand elasticity for the banking product⁶. In the case of deposits, MC can be seen as the opportunity cost (Sander *et al.*, 2004). If banks were operating effectively in a perfectly competitive world, moves in MC would be entirely reflected in BR: the coefficient θ would be equal to one. Such an approach is widely used in the literature, for example in De Bond (2002), Sander *et al.* (2004), De Graeve *et al.* (2007), ECB (2009), Rocha (2012), Van Leuvensteijn *et al.* (2013), Daracq Paries *et al.* (2014), Leroy and Lucotte (2015) among others. We do not call into question this approach, but the way it is empirically implemented.

For deposit rates, the marginal cost price considered usually corresponds to the price of unsecured funding. This approach is justified by the fact that banks traditionally price their retail products in relation to the marginal cost of unsecured funding (Cadamagnani *et al.*, 2015). This cost is usually approximated by a market interest rate for unsecured funding, the EURIBOR in the case of the Eurozone. As it appears in De Bond (2002) *e.g.*, the underlying idea behind this widely spread custom is that market interest rates are seen as the most appropriate marginal cost prices due to their "*accurate reflection of the marginal costs faced by banks*". Consistently, the vast majority of empirical studies analyzing the pricing of banks' retail products in the Eurozone use EURIBOR rates as benchmarks⁷. We are arguing that this custom is not appropriate anymore.

⁶ In the case of deposits, switching costs, information asymmetries and market power will for example generally imply $\theta < 1$. Huthcheson (1995) provides solid theoretical foundations on this point.

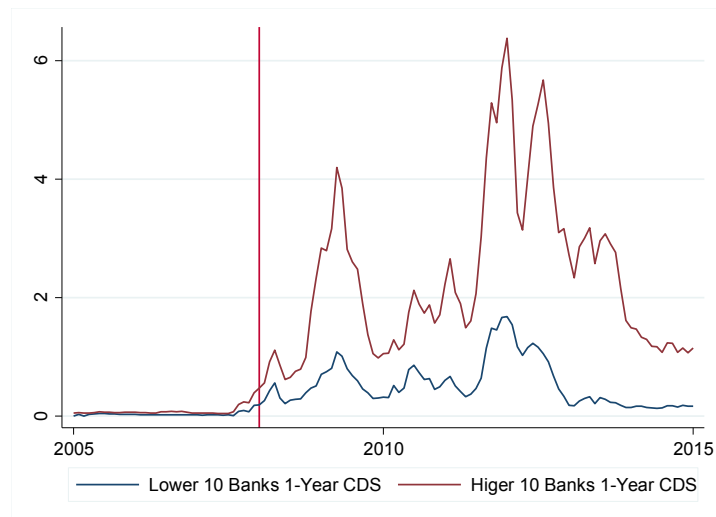
⁷ See for example Sander *et al.* (2004), De Graeve *et al.* (2007), ECB (2009), ECB (2012a), Rocha (2012), Banerjee *et al.* (2013), Van Leuvensteijn *et al.* (2013), Daracq Paries *et al.* (2014), Leroy and Lucotte (2015) among others.

2.2 The irrelevance of the EURIBOR in the post-crisis world

The EURIBOR is computed based on a survey in which some representative banks (by their activity on the euro money market) say how much they would charge a prime bank for an unsecured loan on the money market (Taboga, 2014). Prime banks are supposed to be the less fragile banks, what makes the EURIBOR sometimes called the “*best rate for the best banks*”⁸. To the extent that loans with no guarantee are considered, the EURIBOR is widely used as a proxy for the cost of unsecured funding in economic studies⁹.

The problems of using the EURIBOR as a benchmark for the cost of unsecured funding have been revealed by the 2008 financial crisis. A dramatic change that occurred is that funding conditions have become extremely heterogeneous (ECB, 2012b). As a consequence, the EURIBOR has become by essence non-representative of the funding conditions for the majority of the banks, especially for the banks located in the periphery of the Eurozone, which have been perceived as much more risky. Figure 3 illustrates this fact by showing the average CDS of the 10 banks with respectively the lowest and highest CDS in our sample.

Figure 3: Top 10 versus Bottom 10 Eurozone banks CDS



Source: Markit, authors' sample. CDS are in percentage points.

As funding conditions became extremely heterogeneous the rate at which non-prime banks could borrow became heterogeneously disconnected from the rates at which prime banks can borrow. Under these conditions, econometric or graphical analysis using the EURIBOR will automatically fail to capture any meaningful long-term relationship with deposit rates for non-prime banks¹⁰.

⁸ See Taboga (2014) for a discussion on the EURIBOR.

⁹ It is worth mentioning that the EURIBOR can be an appropriate benchmark for banks others than “prime banks” also when the risk premium the later would pay when borrowing unsecured (compared with prime banks) is negligible or roughly constant over time. This can explain why the use of the EURIBOR as a proxy for the cost of unsecured funding in pre-crisis economic studies used to be not problematic.

¹⁰ In addition to the heterogeneity in funding conditions, two other observations may contribute to make the EURIBOR less relevant: the number of “prime banks” has severely declined (Taboga, 2014) and the liquidity on the unsecured interbank market has severely decreased since the financial crisis (Babihuga and Spaltro, 2014; Financial Times, 2010). The former argument implies that the EURIBOR has become of direct relevance for only few banks in the post-crisis world. The later implies that the EURIBOR may have become an irrelevant proxy even for prime banks’ cost of unsecured funding. Since the

2.3 A new proxy for banks' unsecured funding costs

We build a new index for banks' cost of unsecured funding at the country-level¹¹. Similar to Illes *et al.* (2015), we use the standard structure of interest rates to proxy the interest rate on unsecured debt for bank n at time t :

$$\text{Interest rate}_{n,t} = \text{risk-free rate}_{n,t} + \text{risk premium}_{n,t} + \text{liquidity premium}_{n,t}$$

The risk-free rate is proxied by the Overnight Index Swap rate (OIS rate henceforth) for a given maturity, which is supposed to reflect only the policy interest rate expectations¹². The risk premium is proxied by the Credit Default Swap (CDS henceforth) of the bank n in percentage points for comparable maturities¹³. Thus our index for the real cost of unsecured funding for bank n at time t is simply:

$$\text{Cost of unsecured funding}_{n,t} = OIS_t + CDS_{n,t}$$

With OIS_t the OIS rate at time t for the maturity considered and $CDS_{n,t}$ the CDS of the bank for comparable maturities in percentage points. Using a weighted average of this indicator for all the banks in the country i we obtain an index at the country level for the cost of unsecured funding:

$$\text{Index}_{i,t} = \sum_{n=0}^k \text{Deposit share}_{n,t} * \text{Cost of unsecured funding}_{n,t}$$

Where $\text{Deposit share}_{n,t}$ is the customer deposits of the bank n in proportion of the total deposits of the banks in country i (weighting criteria)¹⁴.

In contrast with the EURIBOR, our index thus takes into account the heterogeneity in funding conditions between prime and non-prime banks. A simple way to see this is that we will now have two different costs of funds for German and Spanish banks (Figure 9, Appendix 1).

EURIBOR is based on declarations rather than on actual rates, it may indeed have become disconnected from the rates at which banks can effectively borrow on the unsecured market, for example by issuing debt.

¹¹ Building a proxy is necessary insofar as there are no monthly data available for bank-specific unsecured debt with a given maturity.

¹² See Taboga (2014) for a discussion.

¹³ We do not explicitly take into account liquidity premia for two reasons: first there is a lack of appropriate data, second CDS already contain a liquidity premium that might thus make up for this omission.

¹⁴ We also considered weighting CDS by banks' total assets: the indicator obtained by doing so was very similar, so that the results presented here were roughly unchanged.

3. Empirical approach

3.1 Methodology

We consider the standard framework in which deposit rates are linked to the cost of unsecured funding, discussed in subsection 2.1¹⁵. We consider the usual specification with EURIBOR (1) and the specification with our index (2).

$$\text{Deposit rate}_{i,t} = \text{constant}_i + \beta \text{EURIBOR}_{i,t} + \varepsilon_{i,t} \quad (1)$$

$$\text{Deposit rate}_{i,t} = \text{constant}_i + \beta \text{Index}_{i,t} + \varepsilon_{i,t} \quad (2)$$

The deposit pricing behavior of banks should imply a linear relationship between deposit rates and the cost of unsecured funding in the long run. No other variable is needed if this long-term relationship holds in theory¹⁶. In econometrics terms, considering the variables as integrated of order 1, this means that the two variables should be cointegrated. In what follows we perform cointegration tests with, in turn, EURIBOR and our index used as a proxy, in a panel set-up at first and then for each country of our sample.

3.2 Data

Our dataset consists of monthly data from 2003:1 to 2015:1.

We use country-level deposit rates from ECB. In order to precisely capture the pricing behavior of banks, we use deposit rates with an agreed maturity a) with a maturity lower than 1 year b) with a maturity between 1 and 2 years and c) with a maturity over 2 years. Deposits from households and non-profit institutions are considered in that they represent the most important share of deposits and the one appearing as highly remunerated (Figure 1).

We obtain banks' CDS from Markit and restrict our sample to retail banks. We select the countries based on data availability for bank CDS¹⁷: Austria, Germany, France, Italy, Spain, Netherlands. One-year CDS contracts on senior unsecured debt are considered in order to closely match deposits' maturity. Banks' total customer deposits data used for weighting are from Bankscope and linearly interpolated. OIS rates for a maturity of 3 months and 1 year are considered.

Standard panel unit-root tests confirm that all our data are integrated of order 1 (Appendix 3), thus making a cointegration analysis appropriate.

¹⁵ Note that we do not question this aspect of the literature in this paper. The pricing of deposits using the cost of unsecured funding as a benchmark is often presented as a traditional feature of banks' pricing behavior (see Cadamagnani *et al.* 2015 eg) and widely spread in the empirical literature. We focus on improving this strand of the literature.

¹⁶ Competition in the banking sector is neglected as we have a short period (7 years, see subsection 3.2) in which this factor is likely not to play a significant role and is possibly taken into account through the constant term.

¹⁷ In order to get a representative proxy a country is selected if we have data for at least four major banks (see Appendix 2).

4. Cointegration tests: EURIBOR versus our index

4.1 Panel analysis

We first make cointegration tests in a panel framework, where we naturally expect more power from the tests given the potential correlation of shocks hitting eurozone economies. Following the connected literature (Rocha, 2012; Bernhofer and Van Treeck, 2013; Leroy and Lucotte, 2014 ; Illes *et al.*, 2015) and given our small N dimension, we primarily use the Westerlund tests (Westerlund, 2007) for cointegration (see Appendix 3). We focus on the post crisis period, where the puzzle appears (results for the pre-crisis period are given in Appendix 4 and indicate cointegration with both the EURIBOR and our index). In order not to take into account the huge volatility following Lehman brother's bankruptcy at the end of 2008, we start our analysis in 2009:1. Table 1 reports the results, where in the first column we stick to the basic approach of Westerlund (2007) and in the second column we account for cross-sectionnal dependence using the bootstrap approach of Westerlund (2007) with 800 replications (maximum allowed in our software).

Table 1: Westerlunds tests for cointegration (2009:1 – 2015:1)

		Westerlunds tests of cointegration							
		Basic				Robust to cross-sectional dependence			
	Variables	Ga statistic	Gt statistic	Pa statistic	Pt statistic	Ga statistic	Gt statistic	Pa statistic	Pt statistic
With EURIBOR	Deposit < 1 year	0.729	0.248	0.675	0.420	0.641	0.309	0.721	0.542
	Deposit between 1 and 2 years	0.076	0.001	0.441	0.125	0.135	0.048	0.596	0.416
	Deposit > 2 years	0.267	0.153	0.214	0.046	0.315	0.478	0.451	0.461
With our Index	Deposit < 1 year	0.000	0.000	0.000	0.000	0.000	0.000	0.000	0.000
	Deposit between 1 and 2 years	0.000	0.000	0.000	0.000	0.001	0.006	0.003	0.003
	Deposit > 2 years	0.002	0.011	0.000	0.000	0.034	0.037	0.054	0.031

Note: The Ga and Gt test statistics test $H_0: a_i = 0$ for all i versus $H_1: a_i < 0$ for at least one i , where a_i is the error correction coefficient (see Westerlund (2007) and Appendix 3). These statistics start from a weighted average of the individually estimated a_i 's and their t-ratio's respectively. Rejection of H_0 should be taken as evidence of cointegration of at least one of the cross-sectional units. The Pa and Pt test statistics pool information over all the cross-sectional units to test $H_0: a_i = 0$ for all i vs $H_1: a_i < 0$ for all i . We use an automatic selection of lags from the AIC criteria. We impose a constant in the cointegration relationship as suggested by the theory. Following the literature, EURIBOR 3months is used for the cointegration relationship with deposits with a maturity lower 1 year (Deposit rates < 1 year), EURIBOR 1 year otherwise. Similarly, OIS 3 months is used in our index for deposits with a maturity lower than 1 year, OIS 1 year otherwise.

All in all, the results indicate that there is no cointegration relationship between deposit rates and the EURIBOR in the post-crisis world, unlike what could be found in the pre-crisis period (see Appendix 4).

Only for deposits with a maturity from 1 to 2 years the Gt statistic suggests the presence of cointegration for at least one panel, but the result barely holds when we consider the robust version of the Westerlund test. In contrast, the cointegration relationship can be inferred with our index, and this for all the deposit maturities considered here.

In Appendix 4, we show that the conclusions are roughly similar when we consider an alternative (residual-based) cointegration test, namely the Pedroni test, although the test is less adapted to our small N case.

4.2 Country-level analysis

To better understand what drives these findings, we run cointegration tests at the country-level. We apply the Engle and Granger method. That is we estimate equations (1) and (2) directly and test for stationarity of the estimated residuals by estimating the following model in each country:

$$\Delta \hat{\varepsilon}_t = \alpha \hat{\varepsilon}_{t-1} + u_t \quad (3)$$

And testing for $H_0: \alpha = 0$ (unit root) vs $H_1: \alpha \neq 0$ (no unit root) using the interpolated Dickey-Fuller critical values as a reference¹⁸. Note that we include lags of the independent variable, with a selection based on the AIC criteria¹⁹. Results are given for the 5% threshold, we indicate in Table 3 directly whether H_0 is rejected or not since the software we use (STATA) doesn't report the p-values.

¹⁸ We didn't include any constant or trend in (3) thus we don't need to use the McKinnon critical values.

¹⁹ With a maximum of 4 lags and a minimum of 2 lags in order to avoid any bias affecting the test (setting a minimum doesn't impact our results).

Table 2: Test for cointegration in subsamples (2009:1 – 2015:1)

		Do the estimated residuals of equation (1) or (2) contain a unit root (test at the 5% threshold)?					
		Austria	France	Germany	Italy	Netherlands	Spain
With EURIBOR	Deposit < 1 year	No	Yes *	No	Yes*	No	Yes*
	Deposit between 1 and 2 years	No	Yes *	No	Yes *	No	No
	Deposit > 2 years	No	No	Yes *	Yes *	No	Yes *
With our Index	Deposit < 1 year	No	No	No	No	No	No
	Deposit between 1 and 2 years	No	No	No	No	No	No
	Deposit > 2 years	No	No	No	No	No	No

Note: (*) when the Dickey-fuller test rejects the presence of a unit root at the 5% threshold, we consider that there is no unit root “no”. Otherwise we note “yes”, which has to be understood as “we have no proof that there is no unit root”. We interpret “rejecting unit root” as evidence of cointegration. We use an automatic selection of lags from the AIC criteria. Following the literature, EURIBOR 3 months is used for the cointegration relationship with deposits with a maturity lower than 1 year, EURIBOR 1 year otherwise. Similarly, OIS 3 months is used in our index for deposits with a maturity lower than 1 year, OIS 1 year otherwise.

As we can see on Table 2, the data do not give support to any cointegration relationship between EURIBOR and the deposit rates for France, Italy and Spain. In contrast, the cointegration relationship is always captured by our index. Interestingly, the relationship fails with the EURIBOR in countries in which banks have become perceived as riskier.

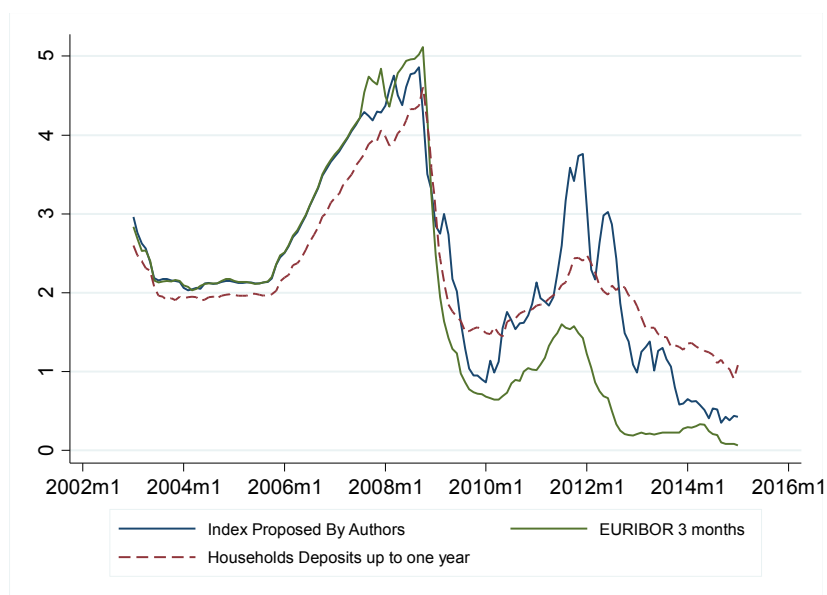
5. Graphical analysis: EURIBOR versus our Index

5.1 Basic observation

When using our index the picture regarding deposit remuneration changes dramatically, especially for periphery-countries (Figure 5).

Deposits do not appear anymore as significantly over-remunerated since the beginning of the financial crisis²⁰ (Figure 4 and 5). Only after 2013 some persistent “over-remuneration” appears, although often limited. This trend is present in all the six countries we analyzed (Figure 9, Appendix 1) with the exception of the Netherlands. This indicates that other factors that were not present before 2013 are at work since then.

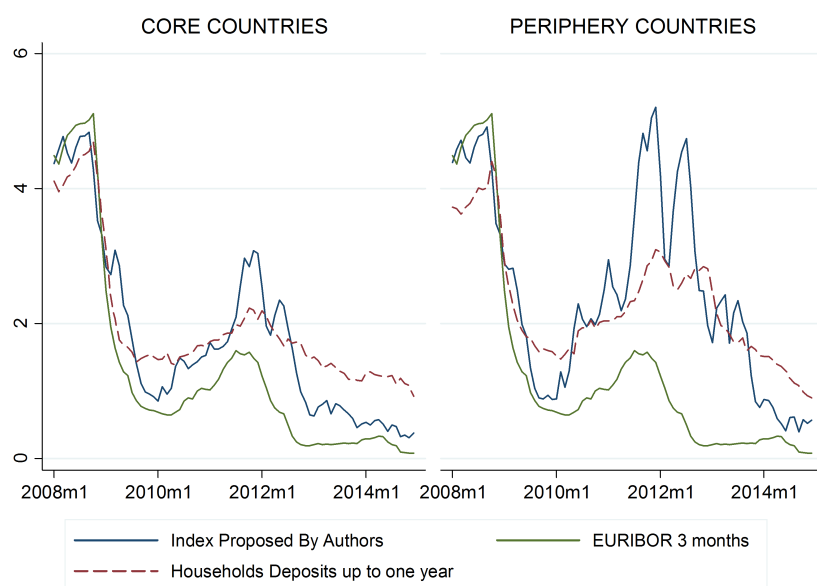
Figure 4: EURIBOR, Authors’ index and Deposit rates in the Eurozone



Source: Authors’ sample, ECB

²⁰ It could be argued that the fact we used 1 year CDS premia rather than the ones of a shorter maturity could partly explain the lower gap with our proxy. We take this into account hereafter by basing our comparisons on predicted rates from two different models: the results clearly indicate that this choice doesn’t have any key impact on our conclusions. Note also that the picture is barely different when we use CDS 6 months (available for fewer data) instead of 1 year, with sometimes a proxy showing even higher rates than when we use CDS 1 year (what could be explained by the fact the short term risk is sometimes perceived as higher than the long term one). In our sample the difference between the index we could build with data for CDS 6 months and the one we use here is only 0.096 basis points on average, thus really minor.

**Figure 5: EURIBOR, Authors' index and Deposit rates in the Eurozone:
Core versus Periphery countries**



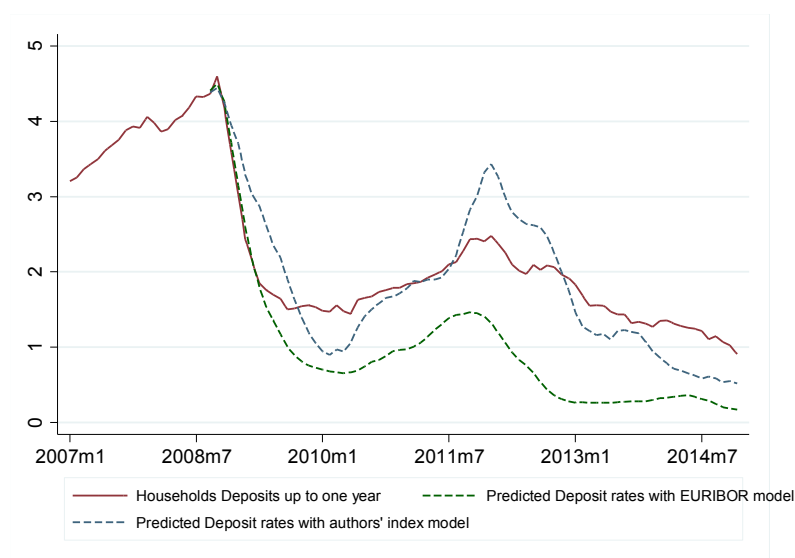
Source: Authors' sample, ECB

5.2 Observation based on predicted rates

In order to quantify to which extent the misuse of the EURIBOR contributes to make deposit rates appear over-remunerated, we look at the level of deposit rates which is predicted by a simple model using the EURIBOR as a key variable, and then compare this prediction with the one from a similar model using our index as a key variable. The model used is the standard Panel Mean-Group model (Pesaran and Smith, 1995). We estimate the parameters of the models for the pre-crisis period, and then use them to predict deposit rates (details of the estimates are given in Appendix 5).

As we can see on Figure 6, using the EURIBOR leads us to predict significantly lower deposit rates than when we use our index (Figure 10 and 11 in Appendix 1 shows the picture for each country). A simple computation shows that 72% of the seemingly over-remuneration of deposits is actually due to the use of the EURIBOR as a benchmark.

Figure 6: Predicted deposit rates with the EURIBOR and with authors' index versus actual deposit rates in the Eurozone:



Source: Authors' estimates, ECB

6. Conclusion

This study shows that the EURIBOR has become an inappropriate benchmark to analyze the pricing of deposit rates in the post-crisis period in the Eurozone. We argued that the reason for this is that the EURIBOR doesn't faithfully reflect the cost of unsecured funding for Eurozone banks anymore, given the substantial heterogeneity in bank funding conditions. In contrast, the index we have built appears more relevant. It captures the post-crisis heterogeneity in funding conditions and restores the cointegration relationship between deposit rates and the cost of unsecured funding.

Our index shows that banks' deposits have actually not been significantly "over-remunerated" since the 2008 financial crisis. We find that 72% of the seemingly over-remuneration of deposits is actually explained by the use of the wrong benchmark, namely the EURIBOR. This observation both attenuates the veracity of the statements made in previous works (ECB, 2009; ECB, 2012a; Daracq Paries *et al.*, 2014) and lays the foundations for future research: the behavior of deposit rates can't be analyzed with the EURIBOR anymore.

Further research remains necessary to understand which new factors have been driving deposit rates in the recent years. Our analysis indeed reveals that new factors have been influencing the pricing of deposit rates in Eurozone countries since 2013. For such subsequent research our paper shows the necessity of using alternative proxies to the EURIBOR. We provide a simple and coherent one.

References:

Babihuga, R. - Spaltro, M. (2014): *Bank Funding Costs for International Banks*. IMF Working Papers no. 14/71, International Monetary Fund, Washington, DC.

Banerjee, A. – Bystrov, V. - Mizen, P. (2013): *How Do Anticipated Changes to Short-Term Market Rates Influence Banks' Retail Interest Rates? Evidence from the Four Major Euro Area Economies*. Journal of Money, Credit and Banking, 2013, vol 45, pp 1375–1414.

Bernhofer, D. - Van Treeck, T. (2013): *New evidence of heterogeneous bank interest rate pass-through in the euro area*. Economic Modelling, 2013, vol. 35, pp 418-429.

Cadamagnani, F. - Harimohan, R. - Tangri, K. (2015): *A Bank within a Bank: How a Commercial Bank's Treasury Function Affects the Interest Rates Set for Loans and Deposits*. In: Bank of England Quarterly Bulletin 2015 Q2

Cottarelli, C. - A. Kourelis (1994): *Financial structure, bank lending rates, and the transmission mechanism of monetary policy*. IMF Staff Papers, vol. 41. International Monetary Fund, Washington, DC., no.4.

Daracq Paries, M. - Moccerro, D. - Krylova, E. – Marchini, C. (2014): *The Retail Bank Interest Rate Pass-Through: The Case of the Euro Area During the Financial and Sovereign Debt Crisis*. ECB Occasional Paper no. 155. European Central Bank, Frankfurt.

De Bondt, G. (2002): *Retail bank interest pass-through: New evidence at the euro area level*. ECB Working Paper, no. 0136. European Central Bank, Frankfurt.

De Graeve, F. - De Jonghe, O. - Vander Venet, R. (2007), *Competition, transmission and bank pricing policies: Evidence from Belgian loan and deposit markets*, Journal of Banking & Finance, 2007, vol. 31, pp. 259-278.

ECB (2009): *Recent developments in the retail bank interest rate pass-through in the Euro area*. In: ECB Monthly Bulletin, August 2009. European Central Bank, Frankfurt.

ECB (2012a): *Changes in Bank financing patterns*. In: *ECB Publications on Financial Stability*, April 2012. European Central Bank, Frankfurt.

ECB (2012b): *Heterogeneity in Euro Area financial conditions and policy implications*. In: ECB Monthly Bulletin, August 2012. European Central Bank, Frankfurt.

Financial Times (2010). *Euribor has been vaporized*. Izabella Kaminska, August 16, 2010 FT Alphaville.

Hutchison, D. (1995). *Retail Bank Deposit Pricing: An Intertemporal Asset Pricing Approach*. Journal of Money, Credit and Banking, 1995, vol. 27, pp. 217-231.

Illes, A. – Lombardi, M. – Mizen, P. (2015): *Why did bank lending rates diverge from policy rates after the financial crisis?* In: BIS Working Papers. Bank for International Settlements, no. 486.

Leroy, A. – Lucotte, Y. (2015): *Heterogeneous Monetary Transmission Process in the Eurozone: Does Banking Competition Matter?* International Economics, 2015, vol. 141, pp 115-134.

Pedroni, P. (1999): *Critical values for cointegration tests in heterogeneous panels with multiple regressors*. Oxford Bulletin of Economics and Statistics, 1999, vol. 61, pp. 653-670.

Pedroni, P. (2004): *Panel cointegration: Asymptotic and finite full sample properties of pooled time series tests with an application to the PPP hypothesis*. Econometric Theory, 2004, vol. 20, pp. 597-625.

Pesaran, M. - Smith, R. (1995): *Estimating long-run relationships from dynamic heterogeneous panels*. Journal of Econometrics, 1995, vol. 68 (1), pp. 79-113.

Rocha, M.D. (2012): *Interest rate pass-through in Portugal Interactions, asymmetries and heterogeneities*. Journal of Policy Modeling, 2012, vol.34, pp. 64-80.

Sander, H. – Kleimeier, S. (2004): *Convergence in euro-zone retail banking? What interest rate pass-through tells us about monetary policy transmission, competition and integration*. Journal of International Money and Finance, 2004, vol. 23, pp. 461-492.

Taboga, M. (2014): *What is a prime bank? A Euribor-OIS spread perspective*. International Finance, 2014, vol. 17, pp. 51-75.

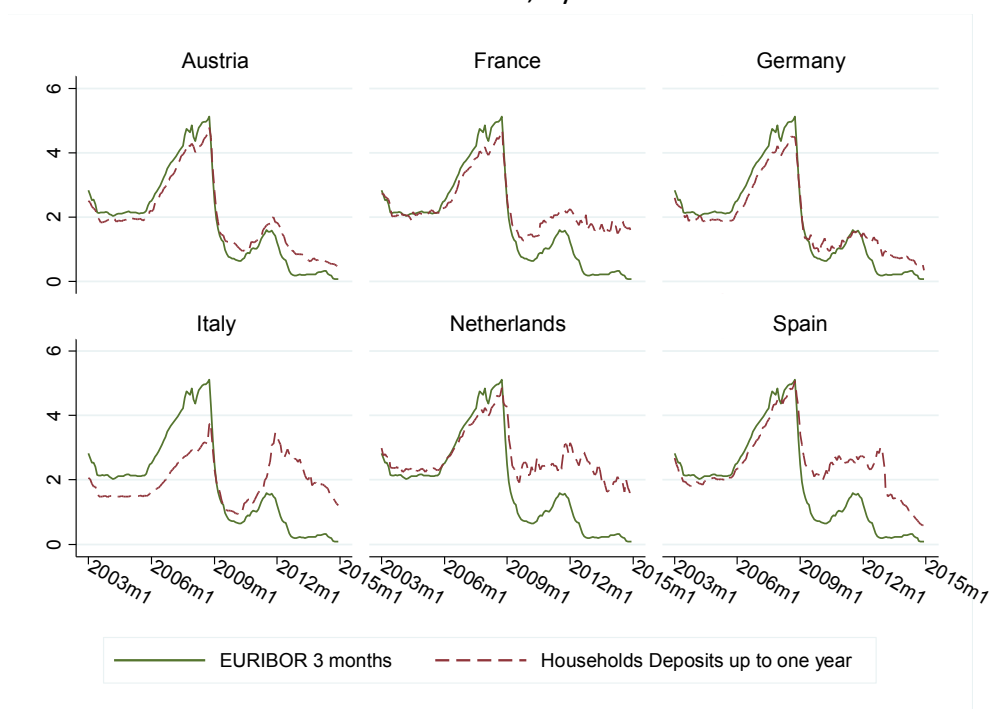
Van Leuvensteijn, M. - Kok Sorensen, C. - Bikker, J.A. – Van Rixtel A.R.J.M. (2008): *Impact of bank competition on the interest rate pass-through in the euro area*. Applied Economics, 2008, vol. 45, pp. 1359-1380.

Westerlund, J. (2007) *Testing for error correction in panel data*. Oxford Bulletin of Economics and Statistics, 2007, vol. 69, pp. 709–748.

Appendix

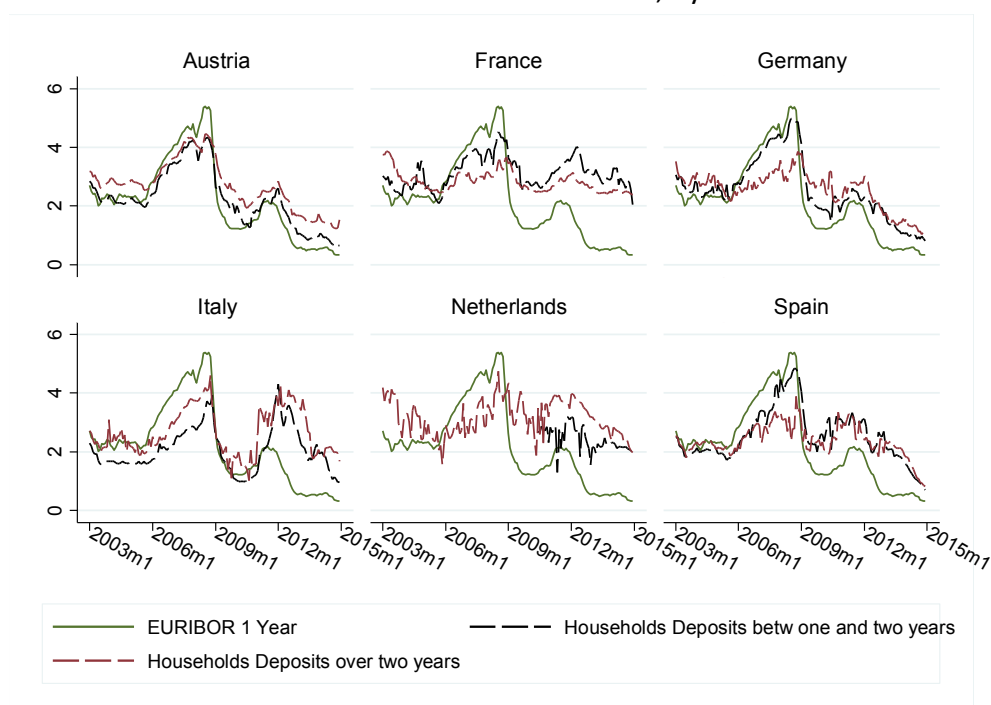
Appendix 1: Graph

Figure 7: Deposit rates (agreed maturity lower than 1 year) and the EURIBOR in the Eurozone, by countries



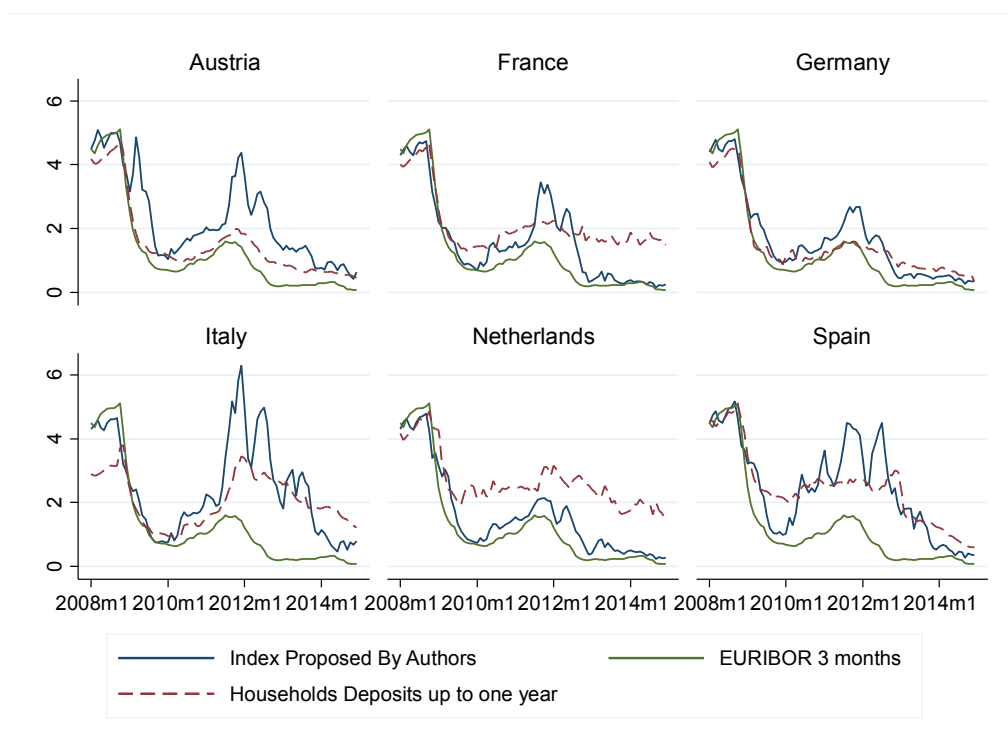
Source: ECB

Figure 8: Deposit rates (agreed maturity between 1 and 2 years and over 2 years) and the EURIBOR in the Eurozone, by countries



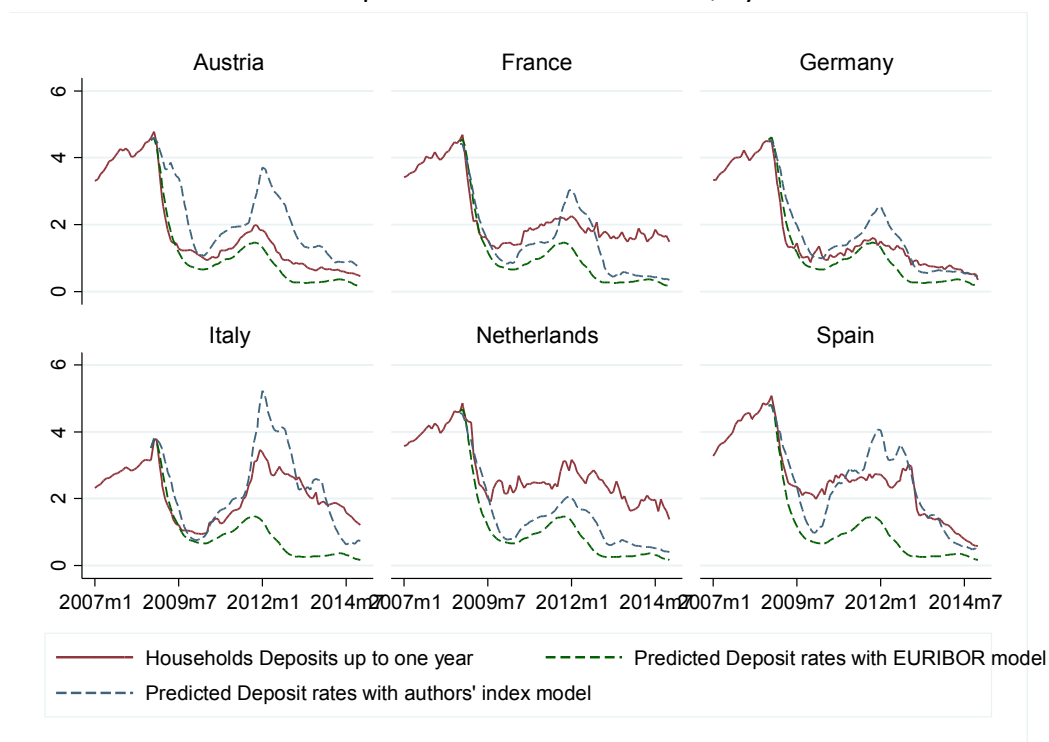
Source: ECB

Figure 9: EURIBOR, Authors' index and Deposit rates in the Eurozone, by countries



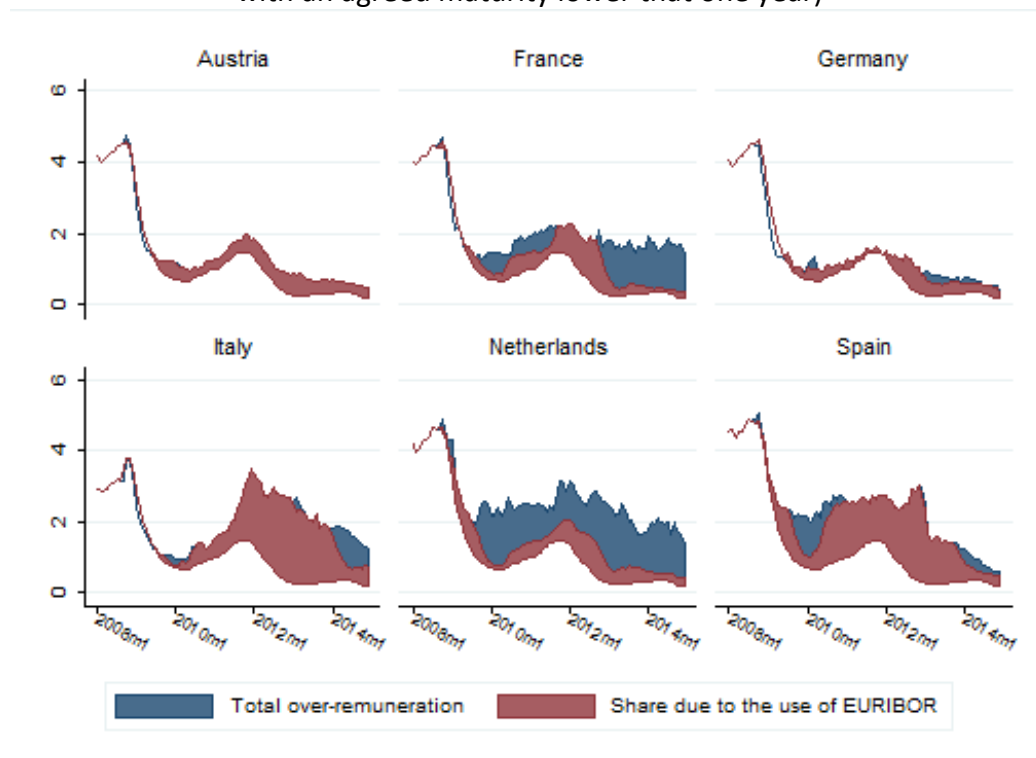
Source: Authors' sample, ECB

Figure 10: Predicted deposit rates with the EURIBOR and with authors' index versus actual deposit rates in the Eurozone, by countries:



Source: Authors' estimates, ECB

Figure 11: Share of deposits over-remuneration due to the use of the wrong proxy (deposits with an agreed maturity lower than one year)



Source: Authors' estimates, ECB

Appendix 2 : Variables

Sample of banks:

Country	Banks
Austria	BAWAG P.S.K. AG * ERSTE GROUP BANK * Raiffeisen Zentralbank Österreich AG * UNICREDIT Bank of Austria AG *
France	BNP PARIBAS * Banque Fédérative du Crédit Mutuel * Crédit Industriel et Commercial SA – CIC Crédit Agricole SA * Crédit Lyonnais Société Générale *
Germany	Bayerischen Hypo- und Vereinsbank AG Bayerische Landesbank Giroz Commerzbank AG * Deutsche Bank AG * DZ Bank AG * HSH Nordbank AG Landesbank BADENWUERTTEMBERG Landesbank Berlin AG Landesbank Hessen Giro Norddeutsche Landesbank-Girozentrale UNICREDIT Bank AG *
Italy	BANCA Monte dei Paschi di Siena S.P.A. * Banca Naz del Lavoro Banca Popolare di Milano * Banco Popolare - Società Cooperativa-Banco Popolare INTESA Sanpaolo S.P.A. * Mediobanca S.P.A. UNICREDITO Italiano S.P.A. * Unione di Banche Italiane Società
Netherlands	Cooperatieve Centrale Raiffeisen-B.A. - Rabobank Nederland * ING Bank N.V. * SNS Bank N.V. * THE RBS N.V. *
Spain	Bankinter * Banco Bilbao Vizcaya Argentaria BBVA * Banco de Sabadell S.A. Banco Popular Espanol S.A. * Banco Santander S.A. * Caixa d'Estalvis i Pensions de Barcelona

** means that the bank is among the top 5 commercial banks (by assets) found in Bankscope in 2014*

Sources:

Variable	Label	Source
Bank CDS	CDS 1 year on Senior Debt Mid rate	Markit
Bank total assets	-	Bankscope. Monthly values linearly interpolated before 2014. After 2014, value of December 2014 (since no data)
Bank total customers deposits	-	Bankscope. Monthly values linearly interpolated before 2014. After 2014, value of December 2014 (since no data)
Deposit rates	Deposit with agreed maturity. Respectively up to one year, between 1 and 2 years, over 2 years.	ECB

Appendix 3: Details on the empirical approach

Results of the unit root tests

To study the order of integration of our variables, we use the standard panel unit-root tests used in the literature we are in line with (Rocha, 2012; Van Leuvensteijn *et al.*, 2013; Leroy and Lucotte, 2014), namely the Im-Pesaran-Shin test and the Hadri test. These tests are suitable for our small N dimension and accounts for potential heterogeneity, while allowing us to take advantage of our panel dimension. We use the whole sample period when possible (2003:1 – 2015:1). We do not include a time trend in the tests since it is clear there is no such trend in the data, and select the number of lags with the AIC criteria (with a maximum of 5). The Im-Pesaran-Shin test has as a nul hypothesis (H0) that all the series have a unit root (versus H1: at least one serie has a unit root). Table A1 shows that for all the series we deal with, H0 cannot be rejected at the conventional thresholds level of 5%. The Hadri test has as a nul hypothesis that all the series are stationary (versus H1: at least one serie has a unit root). As we can see on Table A1, H0 is clearly rejected for all the series we deal with. Doing the tests for the first difference leads us to reject the unit root hypothesis (or for the Hadri test not to reject the stationarity hypothesis) so that we infer the variables are I (1). For the EURIBOR, the standard Augmented Dickey-Fuller test is used, and also shows the series are I(1).

Table A1: Stationarity tests

	Im-Pesaran and Shin test: p-value		Hadri test: p-value		Augmented Dickey-Fuller test, HO rejected at 5% threshold?	
	Level	First Difference	Level	First Difference	Level	First Difference
Deposits up to one year	0.29	0.00	0.00	0.06	-	-
Deposits between 1 and 2 years	0.35	0.00	0.00	0.29	-	-
Deposits over 2 years	0.43	0.00	0.00	0.95	-	-
EURIBOR 3 months	-	-	-	-	No	Yes
EURIBOR 1 year	-	-	-	-	No	Yes
Authors' Index built with OIS 3 months	0.56	0.00	0.00	0.13	-	-
Authors' Index built with OIS 1 year	0.79	0.00	0.00	0.22	-	-

Notes: Im-Pesaran-Shin test has as a null hypothesis "all the series have a unit root" versus H1 "at least one serie has no unit root". Not rejecting is interpreted as no prove of stationarity. The Hadri test has as a null hypothesis that "all the series are stationary" versus H1 "at least one serie has a unit root". All tests are performed without any trend included. The augmented ADF test has as a null hypothesis "the serie has a unit root", not rejecting leads us to infer non-stationarity. It is performed for EURIBOR in so far as this serie is the same for each country.

Information on the cointegration tests used

- Westerlund test

The Westerlund test is part of the so-called “regression based” tests. The underlying idea is to test for the absence of cointegration by determining whether there exists an error correction mechanism for individual panel members or for the panel as a whole. Consider the following Error Correction Model (ECM henceforth), where all variables in levels are assumed to be $I(1)$:

$$\Delta y_{i,t} = c_i + \alpha_i(y_{i,t} - \beta_i x_{i,t}) + \sum_{j=1}^J \alpha_{i,j} \Delta y_{i,t-j} + \sum_{j=1}^K \gamma_{i,j} \Delta x_{i,t-j} + u_{i,t} \quad (4)$$

α_i provides an estimate of the speed of error-correction towards the long run equilibrium for that series i . The $\alpha_{i,j}$ and $\gamma_{i,j}$ coefficients take into account the short term adjustments between the variables. From this equation, Westerlund (2007) computes four statistics. The Ga and Gt test statistics test $H_0: \alpha_i = 0$ for all i versus $H_1: \alpha_i < 0$ for at least one i . These statistics are built from a weighted average of the individually estimated α_i and their t-ratio's respectively. Rejection of H_0 should therefore be taken as evidence of cointegration of at least one of the cross-sectional units. The Pa and Pt test statistics pool information over all the cross-sectional units to test $H_0: \alpha_i = 0$ for all i vs $H_1: \alpha_i < 0$ for all i . Rejection of H_0 should therefore be taken as evidence of cointegration for the panel as a whole.

The main advantages of these tests are that they are very flexible (one can decide on the number of lags J and K to include) and that they allow for an almost completely heterogeneous specification of both the long- and short-run parts of the ECM. This is a major advantage as compared with the alternative Pedroni test (see here below). Westerlund also provides a robust version of these tests which takes into account potential cross-sectional dependence. In this case, robust critical values can be obtained through bootstrapping (see Westerlund (2007)).

In our estimates, similar to Sander and Kleimeier (2004) we allow for a maximum of 4 lags for the differenced variables and then based the selection of lags on the AIC criteria. We naturally include a constant as our model imposes for the ECM. Robust critical values were obtained considering 800 replications for the bootstrapping.

- Pedroni test

Pedroni (1999, 2004) introduced seven test statistics that are computed from the basic regressions of one of the pre-supposed cointegrated variable on the other, similar to the Engle and Granger methodology in essence but in a panel framework here.

The test has the advantage to allow the coefficients to vary across individuals, but the disadvantage of making the assumption that the short term relationship relation between the variable is similar to the long term one (same coefficients). It is best adapted to the cases in which both the N and T dimensions are high, therefore the tests is likely to suffer from size

distortions in our small N model (the reason for which we didn't consider it as our baseline test).

Two kinds of statistics are introduced: **group-means** statistics (that average the results of individual country test statistics) and **panel statistics** (that pool the statistics along the within-dimension). Within each category, non-parametric (*phi* and *t*) and parametric (*ADF* and *v*) test statistics are presented. In the cases in which T is lower than 100, Pedroni (2004) reports that the *ADF* statistics have the best power, with *v* and *phi* performing worse. For this reason, we focus only on the **ADF and t** statistics in our study.

The test accounts for cross-sectional dependence by time-demeaning the variable. We naturally apply this method in our model, and we select the number of lags in the residual analysis based on the AIC criteria, still departing from a maximum of 4 lags. Under the null hypothesis of "no cointegration", the test statistics are distributed $N(0,1)$.

Appendix 4: Other empirical results

Cointegration tests, results in the pre-crisis period:

Table A2: Westerlunds tests for cointegration (2003m1 – 2008m8)

		Westerlunds tests of cointegration							
		Basic				Robust to cross-sectional dependence			
	Variables	Ga statistic	Gt statistic	Pa statistic	Pt statistic	Ga statistic	Gt statistic	Pa statistic	Pt statistic
With EURIBOR	Deposit < 1 year	0.000	0.000	0.000	0.000	0.000	0.001	0.000	0.016
	Deposit between 1 and 2 years	0.000	0.000	0.000	0.000	0.004	0.024	0.000	0.000
	Deposit > 2 years	0.191	0.002	0.004	0.000	0.313	0.539	0.466	0.609
With our Index	Deposit < 1 year	0.000	0.000	0.000	0.000	0.000	0.000	0.000	0.003
	Deposit between 1 and 2 years	0.000	0.008	0.000	0.000	0.001	0.035	0.000	0.008
	Deposit > 2 years	0.005	0.011	0.000	0.002	0.168	0.092	0.175	0.165

Note: The Ga and Gt test statistics test $H_0: a_i = 0$ for all i versus $H_1: a_i < 0$ for at least one i , where a_i is the error correction coefficient (see Westerlund (2007) and Appendix 3). These statistics start from a weighted average of the individually estimated a_i 's and their t-ratio's respectively. Rejection of H_0 should be taken as evidence of cointegration of at least one of the cross-sectional units. The Pa and Pt test statistics pool information over all the cross-sectional units to test $H_0: a_i = 0$ for all i vs $H_1: a_i < 0$ for all i . We use an automatic selection of lags from the AIC criteria. We impose a constant in the cointegration relationship as suggested by the theory. Following the literature, EURIBOR 3 months is used for the cointegration relationship with deposits with a maturity lower 1 year (Deposit rates < 1 year), EURIBOR 1 year otherwise. Similarly, OIS 3 months is used in our index for deposits with a maturity lower than 1 year, OIS 1 year otherwise.

Table A3: Pedroni tests for cointegration, pre-crisis period (2003m1 – 2008m9)

		Pedroni test statistics			
		Panel		Group-means	
	t	t	ADF	t	ADF
With EURIBOR	Deposit < 1 year	-1.833	2.1	1.11	1.749
	Deposit between 1 and 2 years	-2.633	-2.288	-2.324	-1.89
	Deposit > 2 years	-2.308	-0.728	-2.394	-0.271
With our Index	Deposit < 1 year	-1.603	-0.29	-2.151	-0.141
	Deposit between 1 and 2 years	-4.234	-4.123	-3.889	-3.831
	Deposit > 2 years	-3.613	-3.536	-4.165	-3.933

The t-stat must be compared to the distribution of $N(0,1)$: if $|t\text{-stat}| > 1,96$ then the null “no cointegration” is rejected at the 5% threshold, if $|t\text{-stat}| > 2,57$ then the null is rejected at the 1% threshold.

Cointegration tests, results with the Pedroni test in the post-crisis period:

Table A4: Pedroni tests for cointegration, post-crisis period (2009m1 – 2015m1)

		Pedroni test statistics			
		Panel		Group-means	
	t	t	ADF	t	ADF
With EURIBOR	Deposit < 1 year	-1.005	-.1604	-1.301	-.6021
	Deposit between 1 and 2 years	-2.435	-.4885	-2.683	-.2137
	Deposit > 2 years	-2.11	-.2342	-2.687	-.4397
With our Index	Deposit < 1 year	-2.374	-1.853	-3.099	-3.106
	Deposit between 1 and 2 years	-3.654	-2.658	-3.928	-2.875
	Deposit > 2 years	-3.908	-1.2	-4.598	-1.781

Note: The t-stat must be compared to the distribution of $N(0,1)$: if $|t\text{-stat}| > 1,96$ then the null “no cointegration” is rejected at the 5% threshold, if $|t\text{-stat}| > 2,57$ then the null is rejected at the 1% threshold.

Appendix 5: Pool-mean Group estimates used for rates predictions

We use the standard Panel Mean-Group model of Pesaran and Smith (1995) to estimate the relationship between deposit rates and the EURIBOR (respectively, our index) in the pre-crisis world. The use of an Error-Correction Model is justified by the fact we find cointegration between deposit rates and the EURIBOR (respectively our index) on that period (Appendix 4). The Pooled Mean-Group model is favored over the Mean-Group model following the results from the standard Hausman test. The model estimated is thus the following:

$$\Delta y_{i,t} = c_i + a(y_{i,t-1} - \beta x_{i,t-1}) + \sum_{j=1}^J \alpha_{i,j} \Delta y_{i,t-j} + \sum_{j=0}^{K-1} \gamma_{i,j} \Delta x_{i,t-j} + u_{i,t}$$

with y being deposit rates with a maturity lower than one year, x our index in the model (A) and the EURIBOR 3 months in the model (B). a is the error-correction coefficient, it provides an estimate of the speed of error-correction towards the long run equilibrium. The $\alpha_{i,j}$ and $\gamma_{i,j}$ coefficients take into account the short term adjustments: $\alpha_{i,j}$ are the J coefficients for the lags of the dependent variable (the first difference of deposit rates, D.dep_rate) and $\gamma_{i,j}$ the K coefficients for the lags of the first difference of the EURIBOR (D.EUR3m) or our index (D.index). We set $J = K = 3$ for both models for the sake of simplicity. The results of the Pooled Mean-Group estimates are given in Table A5. Predictions are then built for each country using the coefficients obtained here.

Table A5: Pooled Mean-Group regressions, our index (A) versus the EURIBOR (B), pre-crisis period (2003m1 – 2008m9)

	(A)	(B)
<i>EC term</i>		
a (ec coefficient)	-0.3024*** (0.0863)	-0.2403*** (0.0807)
Index _{t-1}	0.9050*** (0.0120)	
EUR3m _{t-1}		0.8891*** (0.0086)
<i>Short term coefficients</i>		
D.dep_rate _{t-1}	0.1769*** (0.0598)	-0.1083 (0.0792)
D.dep_rate _{t-2}	0.1184 (0.0870)	0.0737 (0.0562)
D.dep_rate _{t-3}	0.1172* (0.0698)	0.1378*** (0.0453)
D.index _t	0.0439 (0.0327)	-
D.index _{t-1}	0.0840** (0.0409)	-
D.index _{t-2}	-0.1347** (0.0611)	-
D.EUR3m _t	-	0.3234*** (0.0482)
D.EUR3m _{t-1}	-	0.1998*** (0.0671)
D.EUR3m _{t-2}	-	-0.0005 (0.0729)
<i>constant</i>	0.0464 (0.0308)	0.0203** (0.0096)
N	357	408

Note: the dependent variable is the difference of deposit rates (D.deposit_rate_t). Standard errors are in parentheses. * indicates a pvalue lower than 0.10, ** lower than 0.05, *** lower than 0.01.